# Band Residual Difference Algorithm for Retrieval of SO<sub>2</sub> From the Aura Ozone Monitoring Instrument (OMI)

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Abstract—The Ozone Monitoring Instrument (OMI) on EOS/Aura offers unprecedented spatial and spectral resolution, coupled with global coverage, for space-based UV measurements of sulfur dioxide (SO2). This paper describes an OMI SO2 algorithm (the band residual difference) that uses calibrated residuals at SO<sub>2</sub> absorption band centers produced by the NASA operational ozone algorithm (OMTO3). By using optimum wavelengths for retrieval of SO2, the retrieval sensitivity is improved over NASA predecessor Total Ozone Mapping Spectrometer (TOMS) by factors of 10 to 20, depending on location. The ground footprint of OMI is eight times smaller than TOMS. These factors produce two orders of magnitude improvement in the minimum detectable mass of SO<sub>2</sub>. Thus, the diffuse boundaries of volcanic clouds can be imaged better and the clouds can be tracked longer. More significantly, the improved sensitivity now permits daily global measurement of passive volcanic degassing of SO2 and of heavy anthropogenic SO<sub>2</sub> pollution to provide new information on the relative importance of these sources for climate studies.

Index Terms—Anthropogenic pollution, Aura, Ozone Monitoring Instrument (OMI), SO<sub>2</sub>, volcanic degassing.

# I. INTRODUCTION

ULFUR dioxide is now recognized as the primary volcanic agent of climate change. SO<sub>2</sub> is converted to a sulfate aerosol that has a long lifetime in the stratosphere. The first quantitative data on the mass of SO<sub>2</sub> in a major eruption (El Chichon, 1982) was obtained from the six-UV band NASA Nimbus-7 Total Ozone Mapping Spectrometer (TOMS) [1]. All significant eruptions since 1978 have now been measured by the series of TOMS instruments [Nimbus-7, Meteor-3, ADEOS I, Earth Probe (EP)] [2]–[7]. The SO<sub>2</sub> detection sensitivity was limited to large volcanic clouds by the discrete TOMS wavelengths that were designed for total ozone measurements [8]. EP TOMS has had limited success in detecting noneruptive degassing from exceptionally strong volcanic sources [9] and large SO<sub>2</sub> pollution events [10]. EP TOMS was also able to detect passive volcanic degassing of Popocatepetl volcano, Mexico, when operated in a one-time low-orbit, stare mode configuration in 1997 [11].

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However, the 4–6 DU  $\mathrm{SO}_2$  noise levels in the vertical column (1 Dobson unit (DU) =  $2.69 \times 10^{16}$  molecules/cm²) are too high to measure background  $\mathrm{SO}_2$  amounts or most anthropogenic  $\mathrm{SO}_2$  [12]. Greatly improved sensitivity was demonstrated through detection of volcanic and anthropogenic  $\mathrm{SO}_2$  in Global Ozone Monitoring Experiment (GOME) and SCIAMACHY full spectrum UV data [13]–[15]. However, these sensors need several days to acquire a contiguous global map and hence could miss short-lived pollution events. Infrared detection of volcanic  $\mathrm{SO}_2$  has also been demonstrated with Atmospheric Infrared Sounder (AIRS) data [16], but IR sensors have low sensitivity to tropospheric and boundary layer  $\mathrm{SO}_2$  emissions.

The NASA EOS Aura platform [17], launched on July 15, 2004, carries the Ozone Monitoring Instrument (OMI) [18], a hyperspectral UV/Visible spectrometer with a 2600 km swath for daily, global contiguous mapping that was provided by the Netherlands Agency for Aerospace Programs (NIVR) in collaboration with the Finnish Meteorological Institute (FMI) to the NASA EOS Aura mission for continued monitoring of ozone and other trace gases [19]. The Royal Netherlands Meteorological Institute (KNMI) is the Principal Investigator institute. Reflected sunlight in a fan-shaped narrow field of view is dispersed by a spectrometer and imaged in spatial-spectral dimensions on two-dimensional charge coupled device (CCD) detectors, one for UV and one for visible bands [20]. We use data from the 310-365 nm UV-2 band of OMI with spectral resolution of  $\sim 0.4$  nm [18], [20]. Data are collected from the pushbroom swath in 2-second intervals corresponding to 13-km along-track resolution. Pixels are binned in 60 cross-track positions to provide a nadir resolution of 24 km. A solar calibration is taken at the northern terminator [21].

Currently, calibrated radiances are routinely produced for 12 UV2 OMI wavelengths for operational production of TOMS-like column ozone (OMTO3), SO<sub>2</sub> data (OMSO2) and vicarious calibrations [22], [23]. We have developed a new technique termed the band residual difference (BRD) algorithm that utilizes four of these wavelengths that are positioned at SO<sub>2</sub> band extrema between 310.8 and 314.4 nm. Being less computationally demanding than the spectral fitting maximum likelihood (ML) algorithm [24], the BRD method is also faster and applicable to generation of OMI SO<sub>2</sub> data in a near-real time operational scenario (e.g., for volcanic cloud advisories to aviation). The BRD algorithm used to produce initial Level 2 SO<sub>2</sub> data until such a time as the ML method can be implemented. This paper describes the BRD algorithm and includes examples of preliminary OMI SO<sub>2</sub> retrievals.

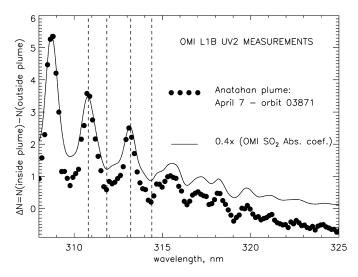


Fig. 1. OMI measured N-value spectra difference inside and outside the Anatahan volcanic plume on April 7, 2005 (orbit 3871) overlapped with a scaled SO $_2$  cross section [25] smoothed with the nominal OMI UV-2 slit function (triangular, FWHM = 0.45 nm [18]). Nadir observational direction, solar zenith angle  $23^{\circ}$ , LER = 0.1.

## II. OMI SO<sub>2</sub> ALGORITHM

#### A. Algorithm Overview

The BRD algorithm makes use of OMTO3 ozone,  $\Omega_T$ , Lambertian effective reflectivity (LER), and calibrated residuals at four UV-2 wavelengths centered on SO<sub>2</sub> bands (Fig. 1) to estimate a total vertical column SO<sub>2</sub> amount,  $\Sigma_o$  assuming that the logarithm of the spectral reflectance ratio in wavelength pairs can be approximated as

$$N_{j} = \operatorname{kmg}_{j}(\alpha_{j}\Omega_{o} + \gamma_{j}\Sigma_{o}) + \frac{\partial S}{\partial \lambda}\Delta\lambda_{j}$$
 (1)

where  $\Omega_o$  and  $\Sigma_o$  are true column ozone and  $\mathrm{SO}_2$  amounts,  $N_j = N\left(\lambda_j^\mathrm{short}\right) - N\left(\lambda_j^\mathrm{long}\right)$  is the measured N-pair value  $(N = -100 * \log_{10}(I/F))$  where I is Earth radiance and F is solar irradiance) for wavelength pair  $p_i$ , j = 1, 2, 3, and  $\gamma_i$  and  $\alpha_i$  are SO<sub>2</sub> and O<sub>3</sub> differential absorption coefficients for the pair;  $m = \sec \theta_0 + \sec \theta$  is the geometrical air mass factor (AMF); relative column average photon path of sunlight entering the atmosphere at solar zenith angle  $\theta_o$  and exiting the atmosphere at the OMI viewing zenith angle  $\theta$ ;  $q_i$  is a correction to m accounting for absorber vertical distribution, column amount and LER (see Sections II-C and D);  $k = 100/\ln 10$ is a scaling factor and the  $S(\lambda)$  term represents any systematic biases in either the measurements (calibration) or the model as well as the scattering atmospheric contribution. The main advantage of using pair N values is that wavelength-independent systematic errors are cancelled and wavelength-dependent error terms become proportional to  $\Delta \lambda_i$ ; the latter is minimized by selecting close wavelength pairs:  $\Delta \lambda_i \rightarrow 0$  (Fig. 1).

Table I shows the pair wavelengths currently used by the BRD algorithm, and differential 225 K ozone and 295 K  $SO_2$  absorption coefficients [25]. Fig. 1 shows an analysis of OMI UV-2 spectra from a  $SO_2$  cloud discharged by Anatahan volcano (16.35°N, 145.67°E; Mariana Islands) on April 6, 2005. Using a pixel within the April 7, 2005 Anatahan cloud (lat:

Pair	$\lambda^{short}$ - $\lambda^{long}$ , [nm]	Pair differential absorption coefficients [atm-cm <sup>-1</sup> ]		
		Ozone: $\alpha_j$	SO <sub>2</sub> : γ <sub>j</sub>	
$\overline{P_1}$	310.8 - 311.9	0.29	5.65	
$P_2$	311.9 - 313.2	0.34	-3.3	
$P_3$	313.2 - 314.4	0.27	4.16	
$P_{B}$	317.6 - 331.3	0.76	1.97	

 $14.34^{\circ}N$ ) and a cloud-free pixel from the same scan position (31—nadir) we obtain an OMI observed differential N-value spectrum to compare with a lab spectrum of  $SO_2$  [25] with band center wavelengths from Table I. The  $SO_2$  spectral band positions agree to within 0.1 nm, thus confirming the OMI wavelength calibration [20], [21].

Equation (1) can be applied to the operational OMTO3 ozone retrieval. The OMTO3 algorithm [22], [23] retrieves the total ozone amount,  $\Omega_T$  and Lambertian Equivalent surface Reflectivity (LER) using the B-pair:  $P_B=(317.6~\rm nm,~331.3~\rm nm)$  under most conditions, and the C-pair:  $P_C=(331.3~\rm nm,~360.2~\rm nm)$  for high ozone and high solar zenith angle conditions. The longer of the two wavelengths is used to derive LER (or cloud fraction); the shorter wavelength provides total ozone. The residuals at the ten other wavelengths are then calculated as the difference between the measured and the computed N-values that account for the effects of multiple Rayleigh scattering, ozone absorption, Ring effect, and surface reflectivity. Using the B-pair and assuming that ozone is the only absorber

$$N_B = \text{kmg}_B \alpha_B \Omega_T + \frac{\partial C}{\partial \lambda} \Delta \lambda_B.$$
 (2)

In (2), both  $\Omega_T$  and  $(\partial C/\partial \lambda)\Delta\lambda_B$  provide closure between the measured and calculated B-pair N values [22], [23]. If  $\mathrm{SO}_2$  is present,  $\Omega_T$  represents the combined effective column absorber amount

$$\Omega_T = \Omega_o + \frac{\gamma_B}{\alpha_B} \Sigma_o \tag{3}$$

where  $\Omega_o$  and  $\Sigma_o$  are the true column ozone and SO<sub>2</sub> amounts. The OMTO3 algorithm next uses retrieved values of  $\Omega_T$  and LER to calculate residual N values  $\operatorname{res}_j = N_j^{\mathrm{measured}} - N_j^{\mathrm{calculated}}$  at SO<sub>2</sub> wavelength pairs:  $p_J, j = 1, \ldots, 3$ . (Table I). In our notation, the  $N_j^{\mathrm{calculated}}$  can be represented similarly to (1)

$$N_j^{\text{calculated}} = \text{kmg}_j \alpha_j \Omega_T + \frac{\partial C}{\partial \lambda} \Delta \lambda_j.$$
 (4)

In the presence of  $SO_2$ , shorter wavelength pair residuals are strongly correlated with the differential  $SO_2$  cross section and can be used for  $SO_2$  estimation [22]. The equation for residuals is obtained by subtracting (4) from (1) and accounting for (3)

$$\operatorname{res}_{j} = N_{j} - N_{j}^{\text{calculated}}(\Omega_{T}, \text{LER})$$

$$= \operatorname{kmg}_{j} \Sigma_{o} \gamma_{j} \left[ 1 - \frac{\alpha_{j}}{\gamma_{j}} \frac{\gamma_{B}}{\alpha_{B}} \right] + \text{bias.}$$
(5)

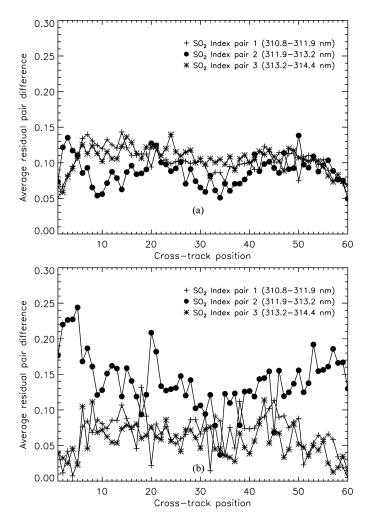


Fig. 2. Global equatorial pair residuals (daily average biases for each cross-track pixel within  $20^{\circ}$  latitude of the equator) on (a) March 28, 2005 and (b) August 30, 2005.

## B. Background Corrections

Biases resulting from nonperfect instrument calibration as well as from forward model simplifications are empirically corrected. Fig. 2 shows examples of the cross-track variation of global equatorial pair residuals (the average bias for each cross-track position (constant viewing zenith angle,  $\theta$ ) within  $\pm 20^{\circ}$  latitude of the equator, calculated after excluding heavily SO<sub>2</sub>-contaminated pixels and their variation over time. Biases are corrected by subtracting equatorial pair residuals from the raw pair values for each OMI orbit.

Following the equatorial bias correction  $SO_2$  amounts can be analytically estimated from the single wavelength pair residual given by (5)

$$\Sigma_{j} = \frac{\operatorname{res}_{j}(\Sigma) - \langle \operatorname{res}_{j}(\operatorname{Equatorial}) \rangle_{\theta = \operatorname{const}}}{k(\operatorname{sec}\theta + \operatorname{sec}\theta_{o})g_{j}(H_{\Sigma}, \Sigma)\gamma_{j} \left[1 - \frac{\alpha_{j}}{\gamma_{j}} \frac{\gamma_{B}}{\alpha_{B}}\right]}.$$
 (6)

Using three different OMTO3 pair residuals, one obtains independent estimates of  $SO_2$  vertical column amounts within the same OMI pixel:  $\Sigma_j$ . These are further averaged to produce the operational  $SO_2$  vertical column amount. The differences between individual  $\Sigma_j$  estimates are also written to the output file

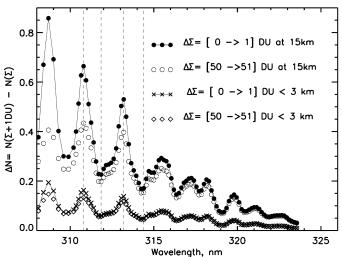


Fig. 3. Modeling of incremental effect of 1 Dobson Unit (1 DU =  $2.69 \times 10^{16} \,$  molecules/cm²) of SO2 on spectral N-values ( $N = -100\log 10(I/F)$ ) at the top of the atmosphere. SO2 was placed at 15 km (upper 2 curves represent small (1 DU) and high (50 DU) SO2 loading) and in the boundary layer (lower curve). The N-values were smoothed with the OMI triangular slit function (FWHM =  $0.45 \,$  nm). OMTO3 SO2 residual wavelengths (Table I) are shown as dashed lines. The assumptions used in RT calculations: Nadir observational direction, overhead sun, LER [22], [23]: LER = 0.05.

to provide a useful indicator of the overall accuracy of the OMI measurements and the BRD algorithm assumptions.

## C. Air-Mass Corrections Due to SO<sub>2</sub> Height and Amount

Initial SO<sub>2</sub> estimates could be made assuming a geometrical AMF  $[g_i = 1 \text{ in } (6)]$ . However, a geometrical approximation to the AMF  $(m = \sec \theta_o + \sec \theta)$  is a simplification because of atmospheric scattering and absorption as well as surface reflection. The approximation fails for low sun elevations because of Earth sphericity. Clouds and aerosols in the boundary layer also affect the AMF in complicated ways. For large SO<sub>2</sub> amounts, using a geometrical AMF will underestimate the SO2 load, due to a reduced UV-light penetration effect. The effect depends on wavelength, reflectivity, observational geometry, SO<sub>2</sub> load and vertical profile. Fig. 3 illustrates the saturation effect for the most favorable observational conditions: overhead sun, nadir view angle, 325 DU standard ozone profile [22], [23], with no clouds or aerosol scattering. The SO2 vertical profiles were assumed to be Gaussian for a volcanic cloud at 15 km (with 1 km standard deviation) and uniform mixing between the surface and 3 km (700 mb) for the boundary layer case.

For more accurate consideration each absorption coefficient in (1)–(6) at each wavelength should be multiplied by its own effective AMF that depends also on the absorber amount and profile. In doing so, the equations become nonlinear in absorber amounts and the retrieval problem becomes circular: the AMFs are required for column amounts estimates, but AMFs themselves require prior knowledge of absorber amounts. However, first-order corrections to the geometrical AMF approximation, q can be estimated using offline forward RT calculations [26]

$$g_j = \frac{10^3}{\text{km}\gamma_j} \frac{\Delta N_j}{\Delta \Sigma} \tag{7}$$

where  $\Delta N_j$  is the pair  $N_j$  value increment due to a small column  $SO_2$  change (assuming fixed  $SO_2$  profile, reflectivity and ge-

TABLE II

CORRECTION FACTORS TO GEOMETRICAL AMF FOR 5% SURFACE
REFLECTIVITY AND 325 DU MID-LATITUDE OZONE PROFILE [22], [23],
OVERHEAD SUN, AND NADIR VIEWING DIRECTION, NO AEROSOL OR CLOUDS

SO <sub>2</sub> Column amount	SO <sub>2</sub> = 0 - 10 DU		SO <sub>2</sub> =50-60DU	
Plume height	<3 km	15km	< 3km	15km
P1	0.21	0.89	0.16	0.48
P2	0.27	1.06	0.22	0.70
P3	0.25	0.99	0.21	0.68

ometry) and  $\gamma_i$  is the differential SO<sub>2</sub> absorption coefficient (atm-cm<sup>-1</sup>) at wavelength pair  $p_j$ . The  $N_j$  values were calculated with a forward RT model assuming different SO2 loads and vertical profiles (Fig. 3). The  $g_i$  factors were calculated from (7) for different wavelength pairs  $P_1$ – $P_3$ . As can be seen from Table II, g factors are close to 1 only for upper tropospheric/stratospheric plumes containing small SO<sub>2</sub> loads (<10 DU). Fresh stratospheric plumes typically have much larger SO<sub>2</sub> loads (>50 DU), in which case g is greatly reduced ( $\sim$ 0.5–0.7) due to the reduced penetration of UV light. On the other hand, for small SO<sub>2</sub> sources that are expected to produce plumes in the boundary layer, the g factor is  $\sim$ 0.2–0.3, due to the penetration effect, especially at shorter UV wavelengths (Table II). The penetration problem is exacerbated at large solar zenith angles and large view angles (off-nadir pixels) as well as for increased ozone amounts. Therefore, the detection of small SO<sub>2</sub> plumes becomes more challenging for middle and high latitudes. In any case, both the SO<sub>2</sub> altitude and load should be known approximately beforehand to allow reasonable AMF corrections. The whole problem could then be solved iteratively by assuming a geometric air-mass factor as a first step, then calculating SO<sub>2</sub> amounts from (6) and AMF corrections from (7) (or interpolated q values from Table II), then recalculating  $SO_2$  amounts from (6) and estimating g and so on. However, the  $SO_2$  vertical profile should be known (or estimated) from ancillary sources.

The g factors given in Table II apply to the most favorable observational scenario: overhead sun, nadir viewing position, no aerosols or clouds. However, the impact of solar zenith angle (less than  $70^\circ$ ) and viewing geometry (viewing angle less than  $70^\circ$  and azimuthal angle  $\sim 90^\circ$ ) on the volcanic AMF is reasonably well represented by the geometrical approximation (m). Therefore, the g factors in Table II are applicable to all clear pixels not far off-nadir with moderate solar zenith angles in low and middle latitudes. These cases can be easily identified in OMI data by looking at low reflectivity pixels. We concentrate on such clear cases first (see Section III).

## D. AMF Corrections Due to Underlying Reflectivity

The sensitivity of backscattered radiances to  $SO_2$  increases with increasing reflectivity of the underlying surface [26]. Although enhanced surface reflectivity assists detection of small  $SO_2$  plumes, especially those in the planetary boundary layer (PBL) that otherwise are undetectable by OMI, it will also produce overestimates of actual  $SO_2$  loading if the AMF is not adjusted. Table III compares g factors at LER = 5% (Table II) and LER = 80%. We note that the largest increase in  $SO_2$  sensitivity occurs for PBL  $SO_2$  (up to factor of 5),

TABLE III RATIO OF CORRECTION FACTORS FROM LER = 80% to LER = 5%

SO <sub>2</sub> Column amount	SO <sub>2</sub> = 0 -	· 10 DU	SO <sub>2</sub> =50	- 60DU
Plume Heigt	<3 km	15km	< 3km	15km
P1	4.8	1.2	4.5	1.5
P2	4.7	1.1	4.5	1.3
P3	4.7	1.1	4.5	1.3

while for stratospheric volcanic plumes sensitivity increases by only  $\sim$ 30%.

The OMI total ozone algorithm (OMTO3) output file includes LER at 331 nm. We correct g factors by interpolating values given in Table III to the actual OMI measured value of LER.

# III. OMI SO<sub>2</sub> DATA OVERVIEW

The OMI SO<sub>2</sub> product (OMSO<sub>2</sub>) uses the HDF5-EOS format. Each OMSO<sub>2</sub> granule corresponds to a single OMI orbit. In addition to standard geolocation and satellite ephemeris parameters, the OMSO<sub>2</sub> product contains the residual pair difference values  $(N_j)$ ; total column SO<sub>2</sub> for three different SO<sub>2</sub> cloud altitudes (PBL, 5 km, and 15 km); OMTO<sub>3</sub> aerosol index, ozone, and reflectivity values [22]; and data quality flags.

## A. Explosive Eruptions

The AURA OMI SO<sub>2</sub> volcanic data set will continue the TOMS SO<sub>2</sub> record, which covers a quarter-century [1]–[7]. Using the BRD algorithm, we have been able to measure SO<sub>2</sub> emissions from every significant volcanic eruption that has occurred since OMI data became routinely available in September 2004. One example, the eruption of Manam volcano (Papua, New Guinea) on January 27–28, 2005, can be seen in [27]. Fig. 4 shows SO<sub>2</sub> emissions produced by an eruption of Anatahan volcano (Mariana Islands) on April 6 (this cloud was used for the analysis shown in Fig. 1). The high sensitivity and contiguous coverage of OMI allows such emissions to be tracked for several days, providing opportunities for trajectory model validation.

Very few events remain undetected by OMI; the main factors impeding detection of lower tropospheric SO<sub>2</sub> emissions are extensive cloud cover and/or high ozone column amounts (both common over the volcanoes of Russia's Kamchatka Peninsula, for example). The latter can overwhelm the SO<sub>2</sub> absorption in lower tropospheric volcanic clouds (also see Section IV).

OMI's high sensitivity to SO<sub>2</sub> also permits one to conclude with more confidence whether an explosive eruption has produced SO<sub>2</sub> or if it has not (i.e., if it is a phreatic, or steam-driven event). This is very important in an aviation hazards context, since production of SO<sub>2</sub> indicates a magmatic eruption with the potential for buoyant upper tropospheric or stratospheric (i.e., aircraft cruising level) plumes.

# B. Passive Degassing

The OMI BRD algorithm has permitted the first daily, spacebased measurements of passive volcanic SO<sub>2</sub> degassing (e.g.,

<sup>&</sup>lt;sup>1</sup>http://toms.umbc.edu.

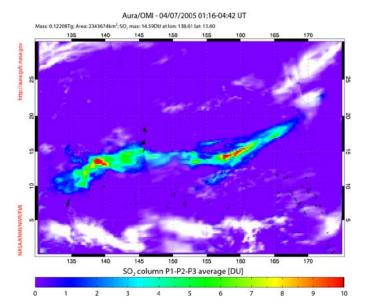


Fig. 4. OMI  $SO_2$  image of the Anatahan (16.35°N, 145.67°E) eruption cloud on April 7, 2005, produced by an explosive eruption on April 6. White regions are meteorological clouds.

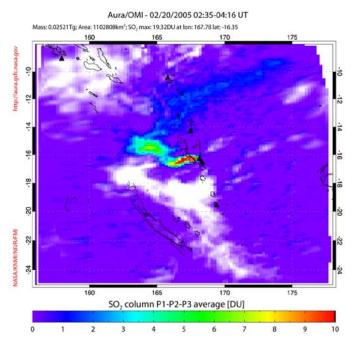
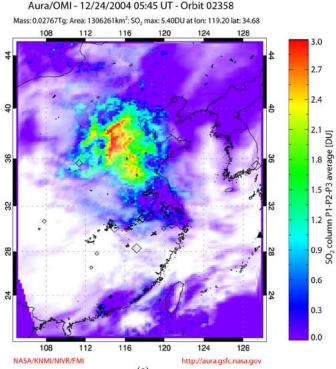


Fig. 5. OMI  $SO_2$  image of passive degassing from Ambrym volcano, Vanuatu (16.25°S, 168.12°E) on February 20, 2005. White regions are meteorological clouds.

[28], [29]) in the lower troposphere. Strong  $SO_2$  sources (e.g., [29]; Fig. 5) can be tracked on a daily basis with OMI (in the absence of significant cloud cover), whilst for weaker sources a successful approach has been to generate weekly or monthly averages of OMI  $SO_2$  data to increase the signal to noise ratio (e.g., [29]).

## C. Anthropogenic SO<sub>2</sub> Pollution

We have also achieved very promising measurements of anthropogenic SO<sub>2</sub> emissions using the BRD algorithm. SO<sub>2</sub> emissions have been measured by OMI over known sources



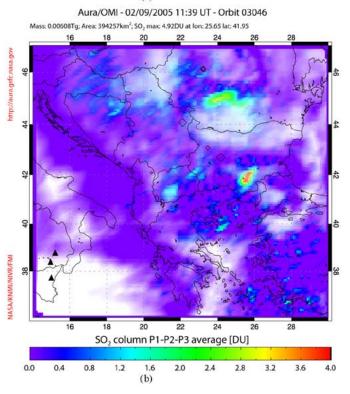


Fig. 6. OMI measurements of anthropogenic  $SO_2$  emissions in the PBL. (a) Air pollution in a cloud-free region of eastern China on December 24, 2004. Clouds are shown in white. (b)  $SO_2$  emissions from sources in S.E. Europe (chiefly in Romania and Bulgaria) on February 9, 2005. Note the low background noise ( $< 0.5 \ DU$ ) in both images.

of air pollution, such as the Ohio valley in the U.S., Eastern China, and Eastern Europe (e.g., Fig. 6). The most significant discovery to date has been the detection of  $SO_2$  emissions from individual copper smelters in South America and elsewhere. These measurements will be discussed in a separate paper [30].

TABLE	IV
OMI SO <sub>2</sub> BACKGROUND	NOISE ESTIMATION

Region	Mean, DU	Standard deviation, DU
North Atlantic, January 2005, PBL SO <sub>2</sub>	-0.066	0.50
South Pacific, January 2005, SO <sub>2</sub> cloud at 15 km	-0.050	0.22

Fig. 6 shows OMI SO<sub>2</sub> retrievals in polluted regions of eastern Asia and Eastern Europe. These examples show that OMI can observe SO<sub>2</sub> emissions in the PBL on a daily basis, thereby improving on GOME and SCIAMACHY, which need several days to acquire a contiguous global map [13]–[15] and hence could miss short-lived pollution events. We note that the SO<sub>2</sub> enhancements detected by OMI in Eastern Europe in February 2005 (Fig. 6(b)) correspond in both location and approximate column amount to GOME observations from February 1998 reported in [14]. These SO<sub>2</sub> emissions are sourced from lignite-burning power plants in the Balkan region [14].

#### IV. DATA QUALITY ASSESMENT

Assessment of OMI data quality is difficult as minimal SO<sub>2</sub> validation data are currently available. Errors will not necessarily be randomly distributed over the globe, but will typically increase with solar zenith angle, large ozone, or SO<sub>2</sub> column amounts and in the presence of clouds and heavy aerosol loading.

With a lifetime of about a day in the lower troposphere, the amount of SO<sub>2</sub> in the PBL is typically very small (less than 0.5 DU except very near to a source). In nonpolluted regions, including most of the Southern hemisphere, the amount is near zero. Thus, the retrieval sensitivity can be estimated from the noise level in background areas. An initial evaluation for two assumed SO<sub>2</sub>-free regions, over the N. Atlantic (40–60°N, 10–45°W) and S. Pacific (0–40°S, 120–180°W) in January 2005, produces the results shown in Table IV. The N. Atlantic case assumes a boundary layer SO<sub>2</sub> profile and is applicable to a pollution scenario at midlatitudes in winter. The S. Pacific example is for a volcanic SO<sub>2</sub> cloud at 15 km and, therfore, shows the noise expected under optimum retrieval conditions (overhead sun, upper tropospheric/stratospheric SO<sub>2</sub> cloud).

We, therfore, expect the standard deviation of OMI SO<sub>2</sub> retrievals to be 0.5 DU or less, which is ten times lower than TOMS SO<sub>2</sub> data [4]–[6].

When  $SO_2$  is present, the retrieval depends on its vertical distribution and total amount. As most air pollution sources release the  $SO_2$  into the PBL or lower troposphere, we assume a constant mixing ratio distribution in the PBL. The height of the PBL is currently assumed to be 3 km (700 mb), but in the future it could also be specified either from external data or from climatology. As the retrieval dependence on altitude becomes small in the upper troposphere and stratosphere, we assume that eruption clouds are at 15 km (close to the tropopause in the tropics, where most explosive eruptions occur). Passive emissions frequently take place from volcanic vents that release  $SO_2$  into the free troposphere. We initially assume this occurs near 5 km.

The largest errors are expected for cloudy and partially cloudy conditions. Depending on their location relative to the  $SO_2$ , meteorological clouds can shield  $SO_2$  at low altitudes from OMI, or artificially enhance the  $SO_2$  signal above them. In addition, there is a small positive bias associated with reflective meteorological clouds, which produce a bias typically on the order of 0.2 DU  $SO_2$  but up to  $\sim \! 1$  DU in some cases. The bias is most apparent at the edges of clouds, or in the presence of small (subpixel sized), highly reflective clouds.

In polluted regions the sulfate haze from oxidation of older SO<sub>2</sub> constitutes a source of error in the retrievals if not accounted for in the atmospheric model used in AMF estimation. Retrieval errors arise from noise in the radiance measurements, and from simplifications in the atmospheric models and in cross section data. Ash in volcanic clouds can produce as much as 30% error if not accounted for in the AMFs [4], [6], [26]. Passive emissions typically have less than 50 DU SO<sub>2</sub> and are often free of ash so that no error occurs due to ash.

## V. SO<sub>2</sub> VALIDATION PLAN

Comparisons of OMI with Earth Probe TOMS data for explosive eruption clouds are needed to assure consistency between the databases for extension of the TOMS eruption SO<sub>2</sub> mass time series. EP TOMS operations are planned for at least 2 years overlap with OMI.

Subsequently, we plan to compare OMI total column  $SO_2$  with AURA Microwave Limb Sounder (MLS)  $SO_2$  measurements. The advantage of such comparisons is that MLS provides the vertical distribution of  $SO_2$  in the stratosphere and upper troposphere (down to 215 hPa) [31]. Using this information we will be able to specify the profile for the AMF  $g_i$  in (7).

In addition to MLS, other A-Train sensors are capable of measuring  $SO_2$  and will provide coincident or near-coincident correlative observations for validation of OMI  $SO_2$  data. On Aura, the Tropospheric Emission Spectrometer (TES)² has IR channels suitable for  $SO_2$  measurements. TES is a pointable Fourier Transform Spectrometer capable of tropospheric  $SO_2$  profile retrievals in limb or nadir viewing mode. On Aqua, the IR AIRS instrument offers high sensitivity to  $SO_2$  and a similar footprint dimension to OMI ( $\sim$ 13.5 km) [16], and is, therfore, an important source of correlative observations. However, due to interference from water vapor AIRS is typically unable to provide correlative measurements of  $SO_2$  in the PBL or lower troposphere. Preliminary comparisons of OMI  $SO_2$  data with AIRS and EP-TOMS data for explosive eruptions show that OMI  $SO_2$  columns are accurate for upper tropospheric  $SO_2$  clouds.

The Moderate Resolution Imaging Spectroradiometer (MODIS) on Aqua also has IR channels sensitive to  $SO_2$ . Although MODIS is inherently less sensitive to  $SO_2$  than AIRS or OMI, its high spatial resolution (1 km) will provide information on  $SO_2$  variability and/or meteorological cloud interference on sub-OMI pixel scales. This will be particularly important for evaluation of OMI  $SO_2$  retrievals in the PBL.

Validation of OMI measurements of  $SO_2$  located in the lower troposphere and PBL is more challenging. We plan to use low-altitude aircraft  $SO_2$  measurements (spirals) [12] as well as ground-based column  $SO_2$  measurements from double

Instrument	Typical noise level, DU	Nadir footprint area, km <sup>2</sup>	Detection limit, tons 5 pixels@ 5 σ
TOMS	5	2500	7000
OMI	0.22	312	47

Brewer spectrometer stations and portable UV spectrometers near SO<sub>2</sub> sources. The latter endeavor will be facilitated by the current proliferation of compact UV spectrometers in the volcanological community (e.g., [32]), which is improving the quantity and temporal resolution of ground-based differential optical absorption spectroscopy (DOAS) measurements of SO<sub>2</sub> at degassing volcanoes. The OMI validation effort will benefit from the imminent deployment of a global network of these instruments [33].

#### VI. CONCLUSION

Almost a quarter-century of TOMS volcanic eruption  $SO_2$  masses are now available [6]–[7]. The OMI  $SO_2$  data set will continue the TOMS record but the improved sensitivity and smaller footprint of OMI will extend the range of detection to smaller eruptions and older clouds, and to degassing volcanoes. A comparison of the volcanic cloud detection capability for TOMS and OMI is shown in Table V. A conservative cloud detection algorithm requires five adjacent pixels each containing more than five noise standard deviations. A dramatic 150-fold improvement is found.

Using OMI data, we can directly compare daily global  $SO_2$  emissions from anthropogenic and volcanic sources for the first time, and thus provide important new constraints on the relative magnitude of these fluxes. Such measurements are essential given the growing concern over the effects of anthropogenically forced climate change and intercontinental transport of air pollution. The fast BRD  $SO_2$  retrieval is also amenable to operational  $SO_2$  alarm development, and near real-time application for aviation hazards and volcanic eruption warnings.

The BRD algorithm sensitivity does not represent the maximum sensitivity theoretically achievable with OMI and, hence, future algorithm improvements should allow even weaker  $SO_2$  sources to be monitored routinely. These measurements are expected to produce the best estimates to date of the volcanic contribution to global atmospheric  $SO_2$  abundances.

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